

# **Electricity Markets Complex Adaptive Systems (EMCAS) Model**

## **A New Long-Term Power Market Forecasting Tool**

**Guenter Conzelmann  
Center for Energy, Environmental, and Economic  
Systems Analysis (CEEESA)  
Argonne National Laboratory (ANL)  
9700 South Cass Avenue  
Argonne, Illinois 60439, USA**

**phone: 630-252-7173 fax: 630-252-6073  
email: [guenter@anl.gov](mailto:guenter@anl.gov)**



Argonne National Laboratory is a  
U.S. Department of Energy research center  
operated by the University of Chicago.



# To Address Market Participant Behavior, EMCAS Uses an Agent-Based Simulation

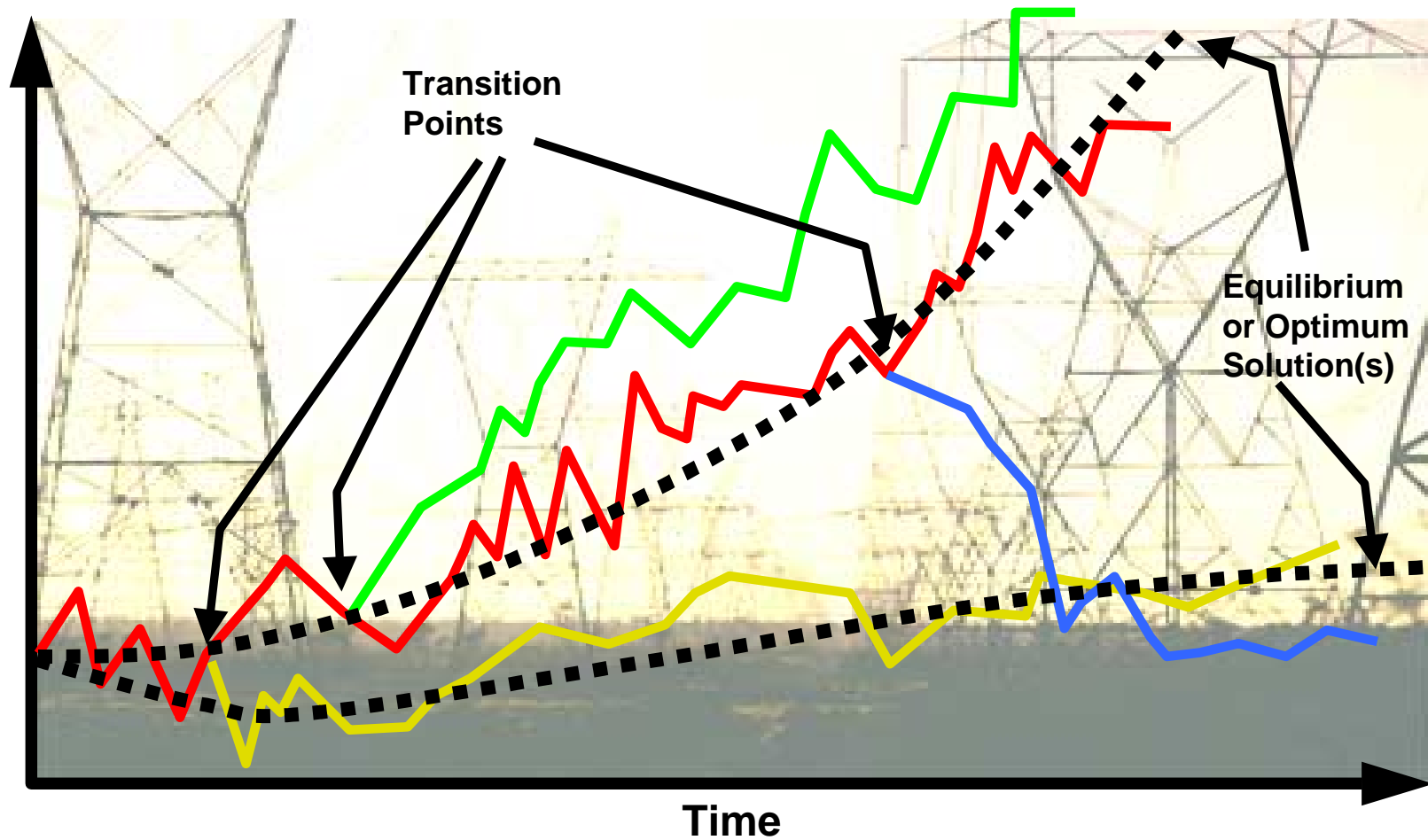
- Represents multiple market participants (agents) with decentralized decision-making
- Incorporates agent learning and adaptation based on performance and changing conditions
- A wide range of market strategies are available to the different agents
- User-specified market rules affect the behavior of individual agents as well as the system

*“[Agent based simulation] has considerable similarity to the mathematical theory of games of strategy, but, unlike the generalized games solved by von Neuman or Nash, these are repeated games with non-zero sum payoffs.”*

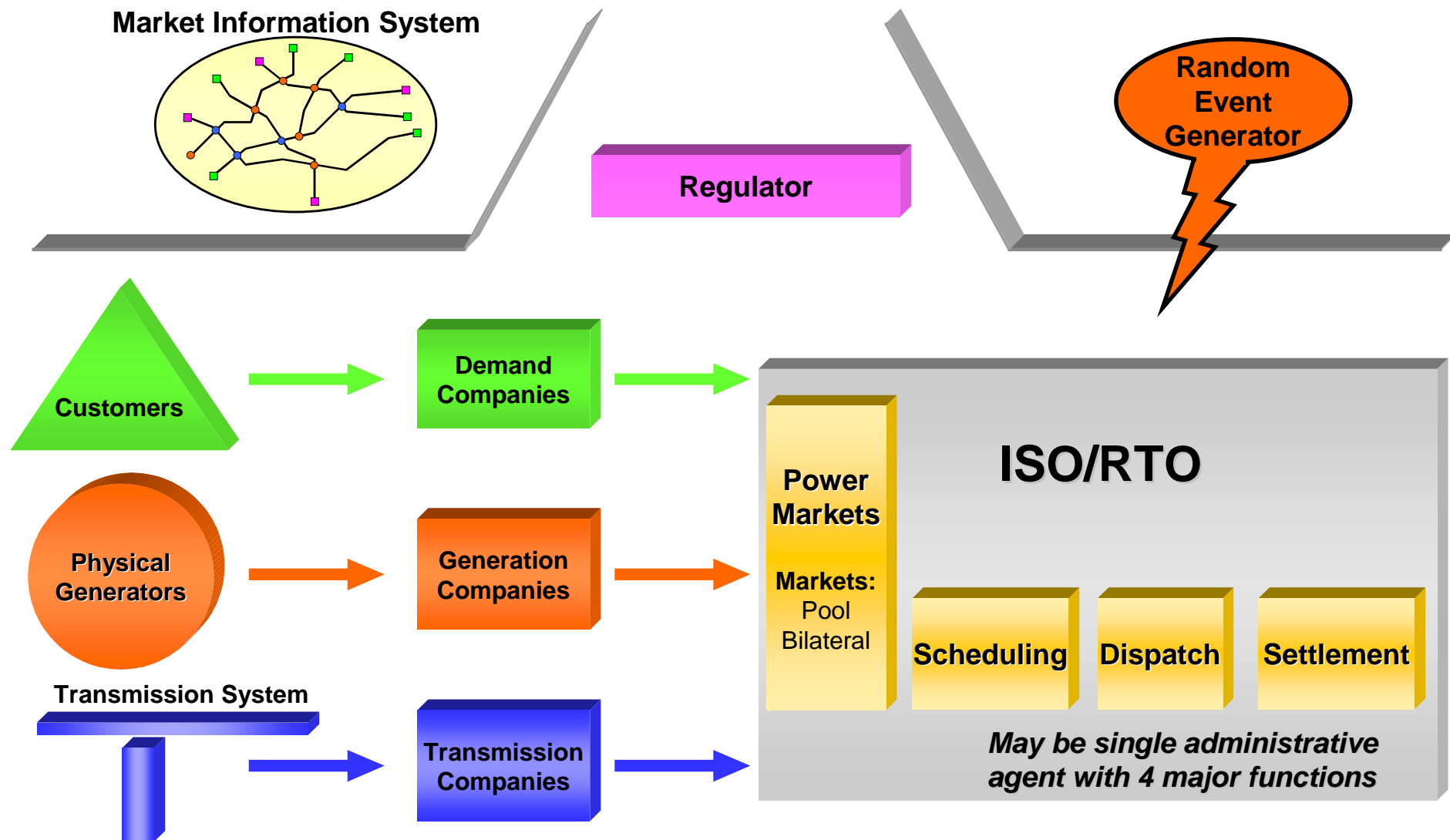
*A.M. Wildberger, EPRI*



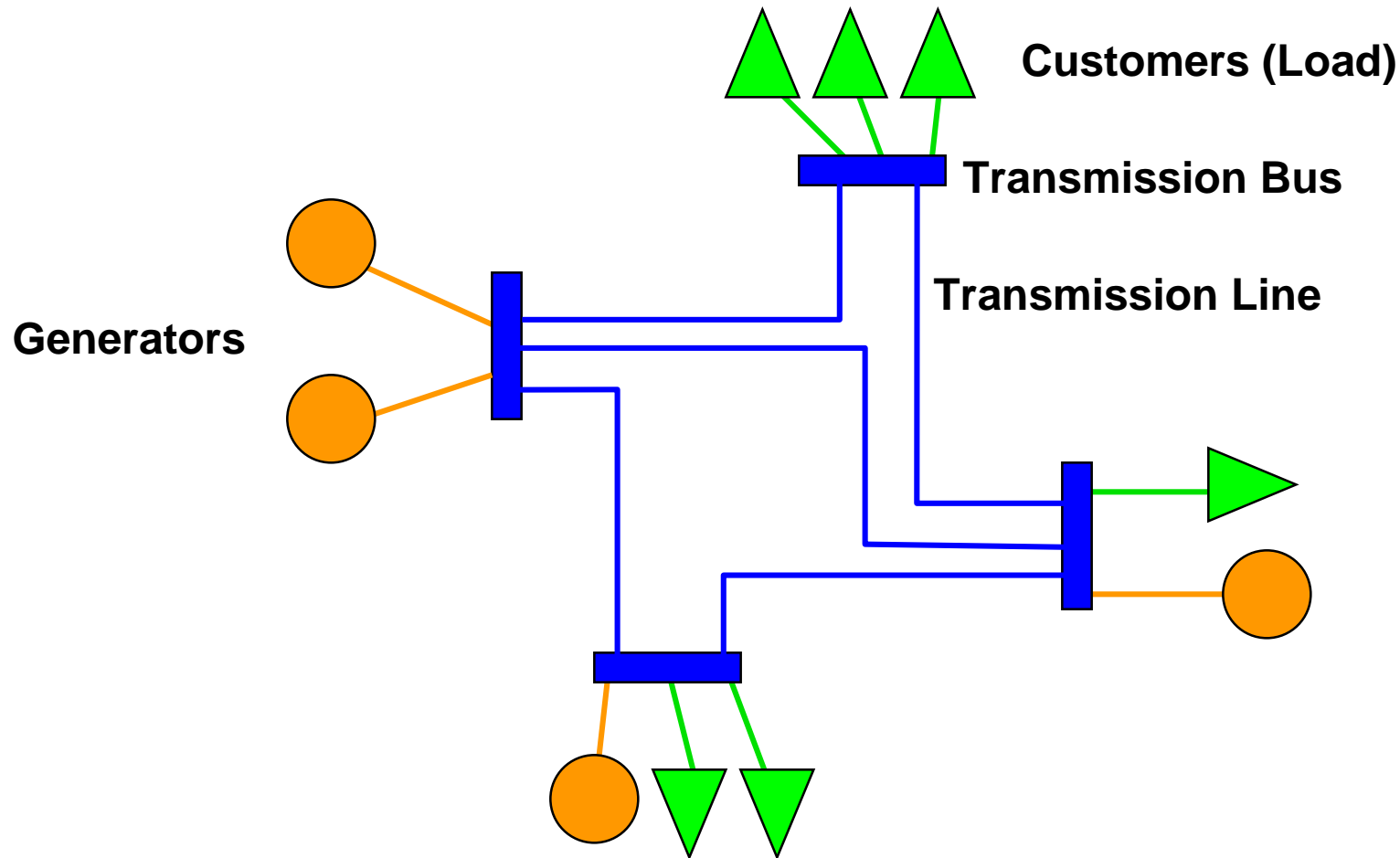
# EMCAS Is Designed to Determine the State(s) that the Market Will Gravitate Toward, and the Transients Involved in Getting There



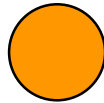
# EMCAS Uses an Agent-Based Architecture to Represent Participants in the Electricity Marketplace



# Generators, Transmission Nodes and Links, and Customers Form the Physical System Configuration

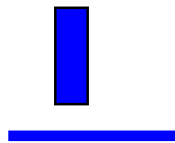


# Generators and Transmission Nodes/Links Are Characterized by Technical and Cost Parameters



**Generator**

**Capacity**  
**Heat rate**  
**Ramp rates**  
**Fuel cost**  
**O/M cost**



**Transmission**  
**Bus**  
**Line**

**Capacity**  
**Voltage**  
**Line loss**  
**O/M cost**

***These are physical components and  
have no decision capability***

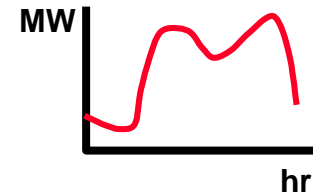


# Customer Agents Represent Electricity Users

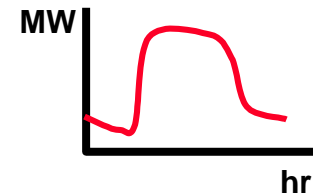
## Load profiles



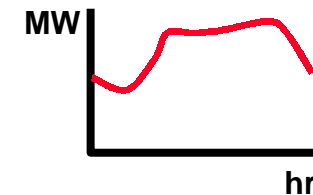
Residential



Commercial



Industrial

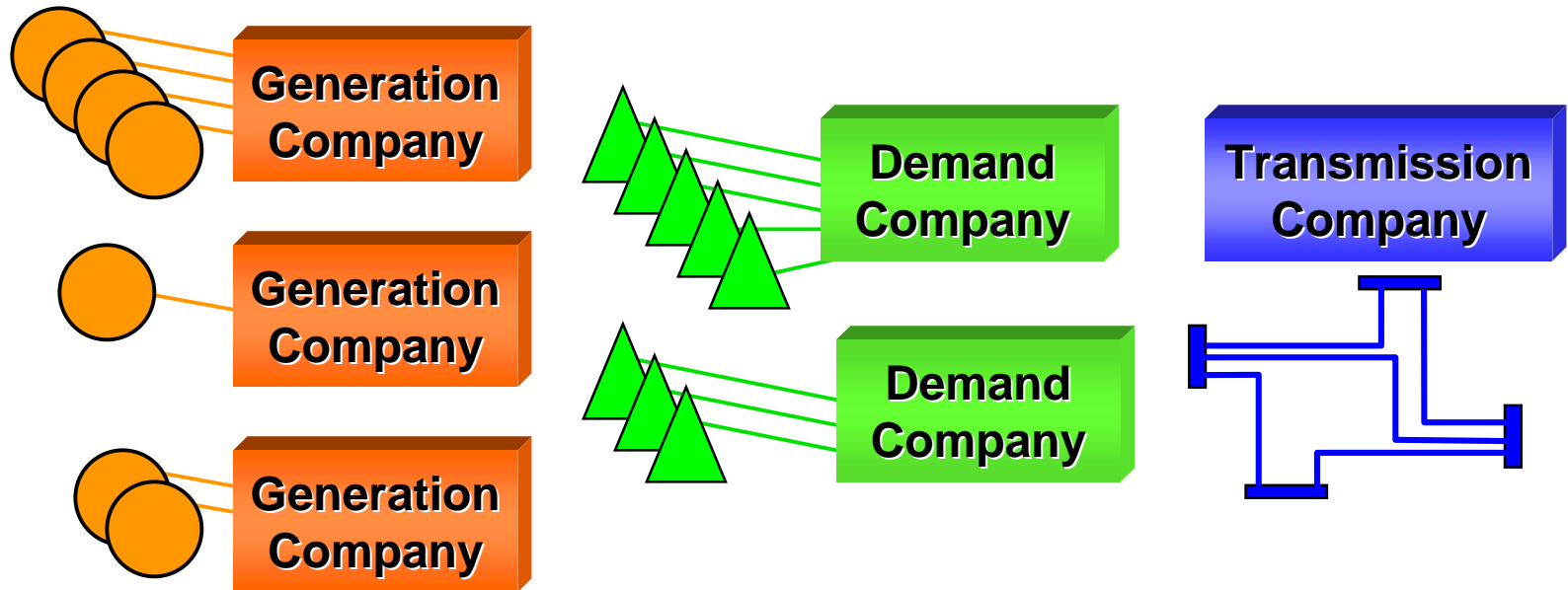


***Customer agents have choices at different times***

- Quantity of electricity purchased***
- Supplier***
- Contract terms***



# The Company Agents Represent Business Operations



**Revenue:**

**Sales of  
generator output**

**Charges to  
customers**

**Transmission  
charges**

**Costs:**

**Fuel, O/M costs,  
capital**

**Purchases of  
electricity**

**O/M costs,  
capital**





# In EMCAS, Company Agents Seek to Maximize the Corporate Utility Function, Not Overall Social Utility

---

- Each company agent can have a set of corporate objectives
  - Profit
  - Market share
  - ...other...
- Multiple objectives can be combined into a utility function

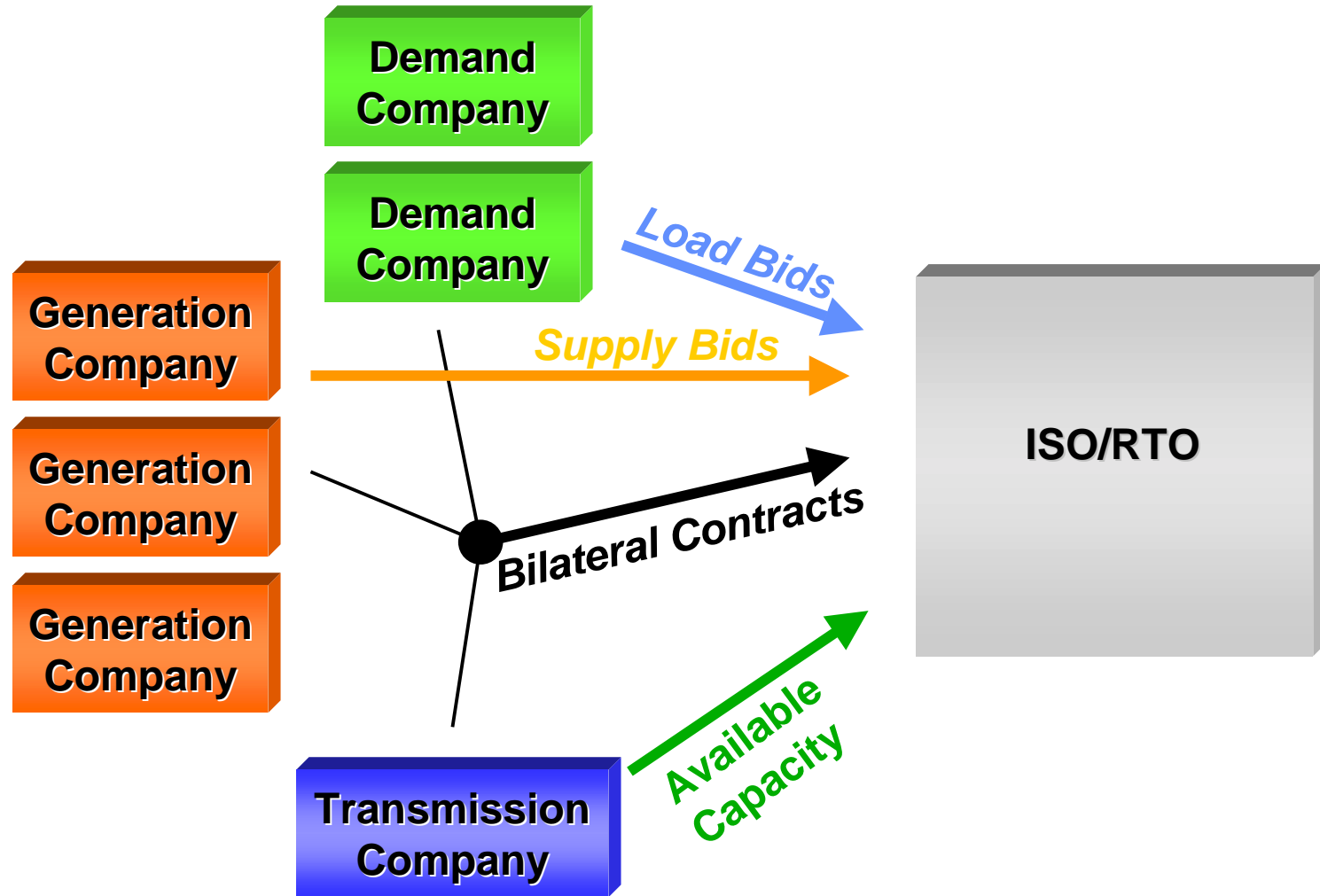
***Utility Function =  $f$  (Profit, Market Share, ..other..)***

***Not all companies necessarily have the same objectives***

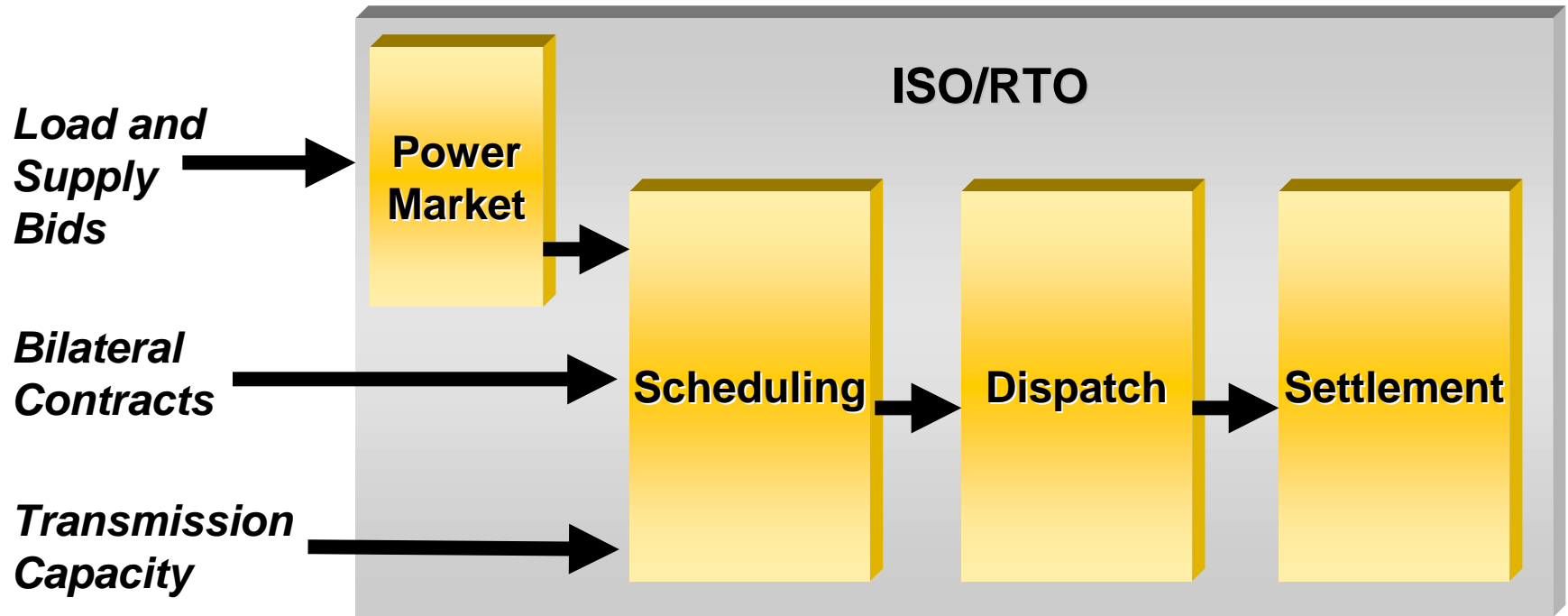
***Not all companies necessarily use the same utility function***



# In the EMCAS Environment, the Company Agents Interact with Each Other and with the ISO/RTO



# The ISO/RTO Has Four Major Functions



# User Inputs Control Key Parts of the EMCAS Simulation

---



**Regulator**

**Sets market rules**

- Bidding rules
- Bilateral contract rules
- Settlement (reimbursement) rules



**Special  
Event  
Generator**

**Creates special situations**

- Generator outages
- Transmission outages
- Unexpected load changes
- Fuel price changes



# The Market Information System Is the Source of the Information that Is Available to All Agents: The Bulletin Board

## Market Information System

System load projections

Scheduled outages

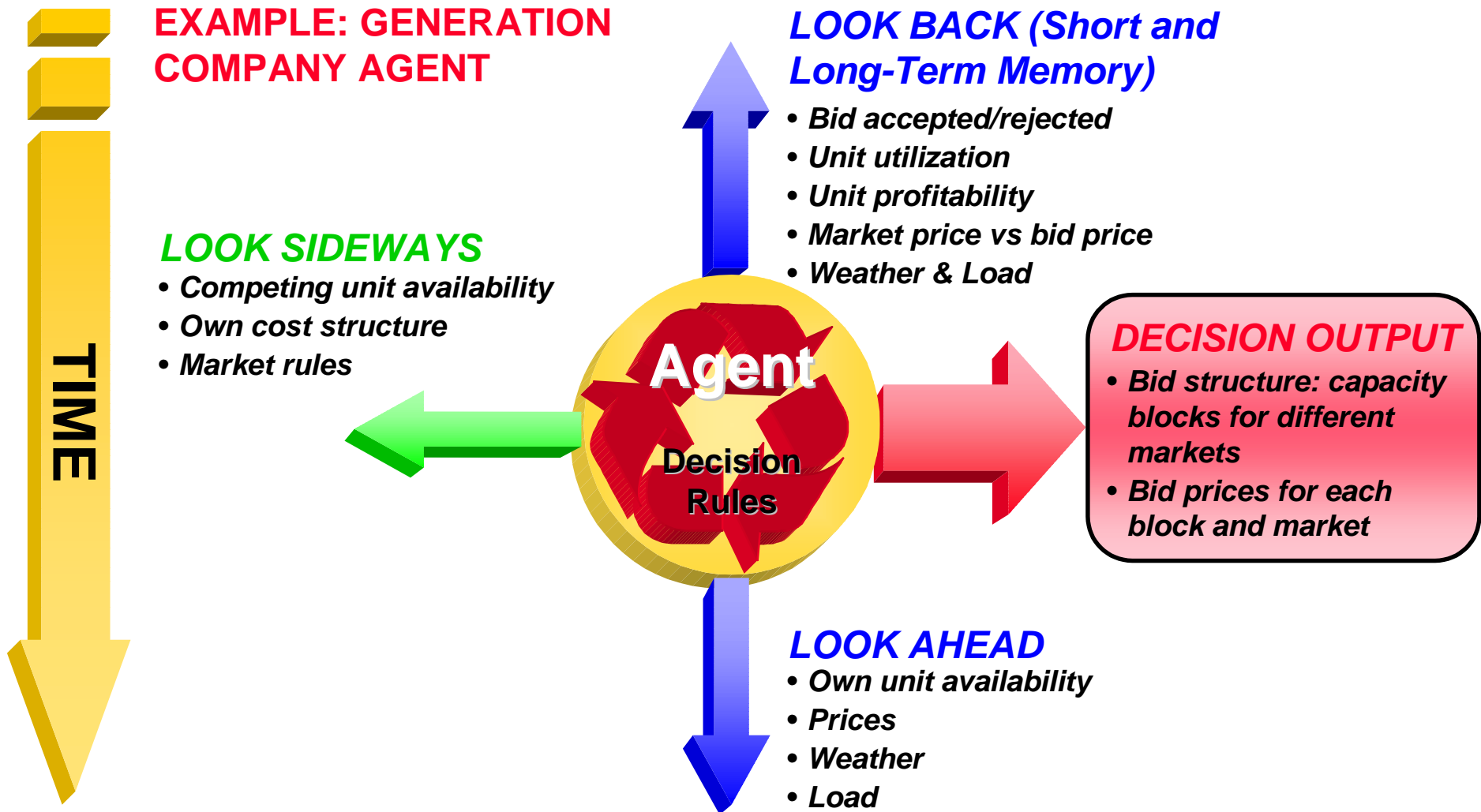
Available transmission capacity

Historical market clearing prices

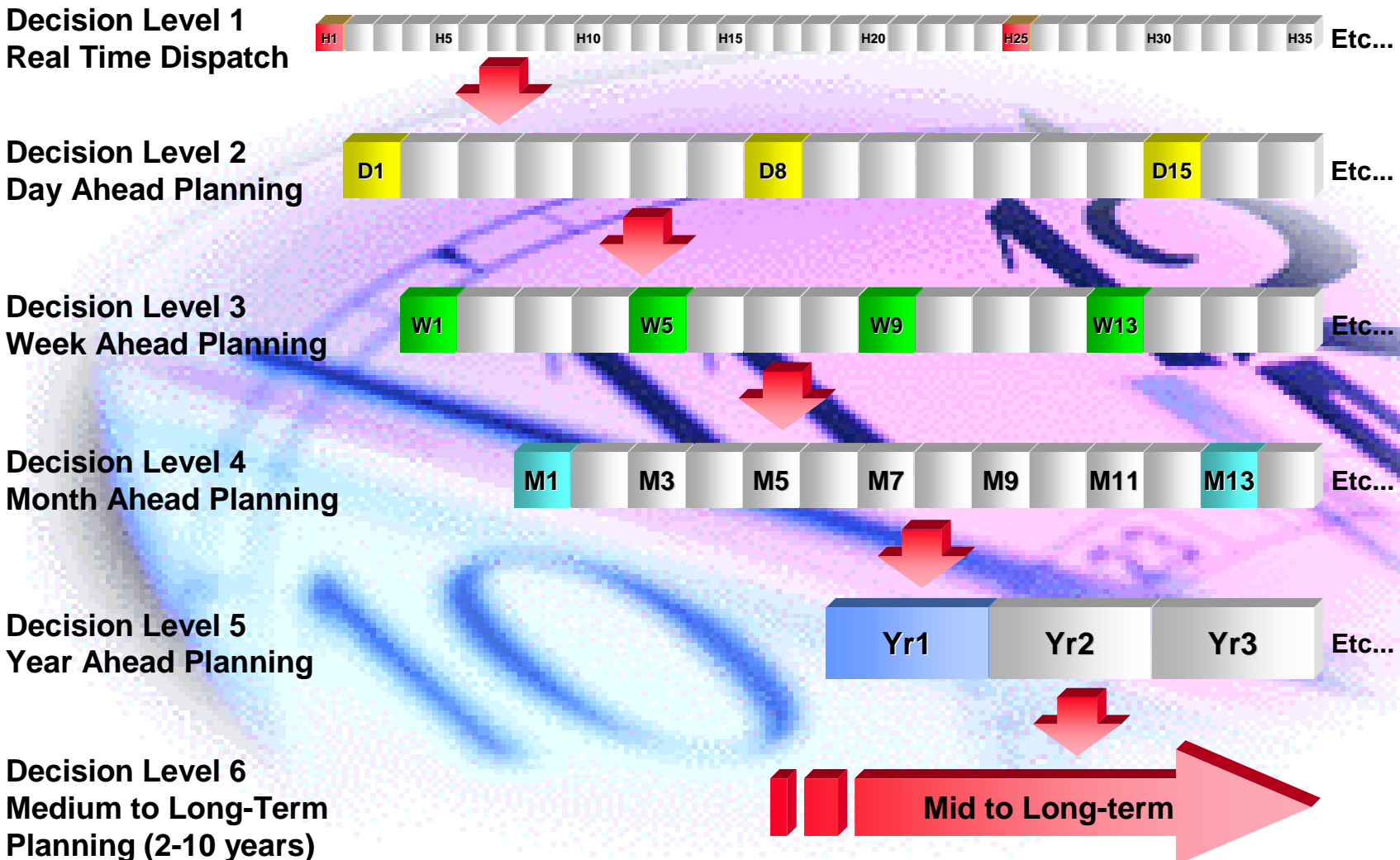
etc.....



# At Each Level, the Agents Exchange Information and Decide Among Options Available to Them



# EMCAS Operates at Six Time-Based Decision Levels That are Interdependent



# ***Level 2 – Day Ahead Planning***

## **Companies Decide on Next Day Strategies**

Decision Level 2  
Day Ahead Planning



**Generation  
Company**

- Longer-term bilateral contracts in place
- Must make unit commitment and pricing decisions
  - Energy market
  - Ancillary services market
  - Day ahead bilateral contract

**Demand  
Company**

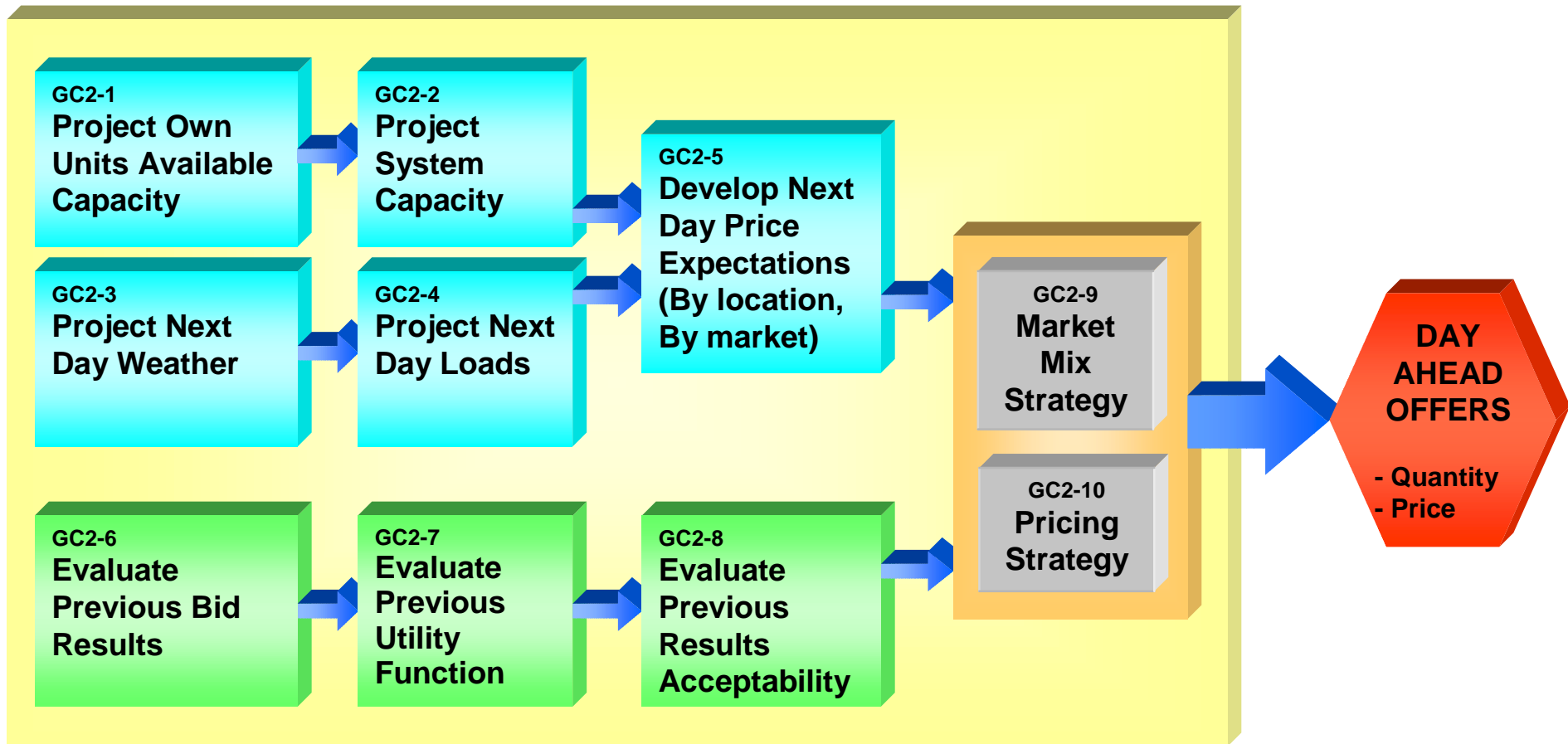
- Longer-term bilateral contracts in place
- Must make purchase decisions
  - Energy market
  - Day ahead bilateral contract





# *Level 2 – Day Ahead Planning*

## **Generation Company Internal Model**



*Each generation company may use different methods for each component of its internal model*



# ***Level 2 – Day Ahead Planning***

## **Generation Company Strategies**

---

- **Possible Market Mix Strategies**

- Bid all capacity into energy (spot) market
- Offer all capacity under day ahead bilateral contracts
- Offer fixed increments into each market
- Withhold capacity from some or all markets
- Increment mix from previous days based on performance
- ...others...

- **Possible Pricing Strategies**

- Bid production cost
- Bid to ensure dispatch
- Bid to increase the market clearing price
- Bid last increment of capacity at high price (hockey stick bidding)
- Adjust prices from previous days based on performance
- ...others...

***Initial company strategies based on market rules are input as part of the initial conditions***



# ***Level 2 – Day Ahead Planning***

## **Company Strategies Are “Tuned” at this Level**

---

**Example: Generation Company Strategy**

- Bid all capacity into Energy (Spot) Market**
- Attempt to increase Energy Market Clearing Price**

***Next Day***

***Energy Market  
Bid Price =  $\alpha$  x Production Cost***

### **Examples for Strategy Tuning Rules**

**If previous day bid accepted       $\alpha$  =  $\alpha$  (previous day) x 1.05**

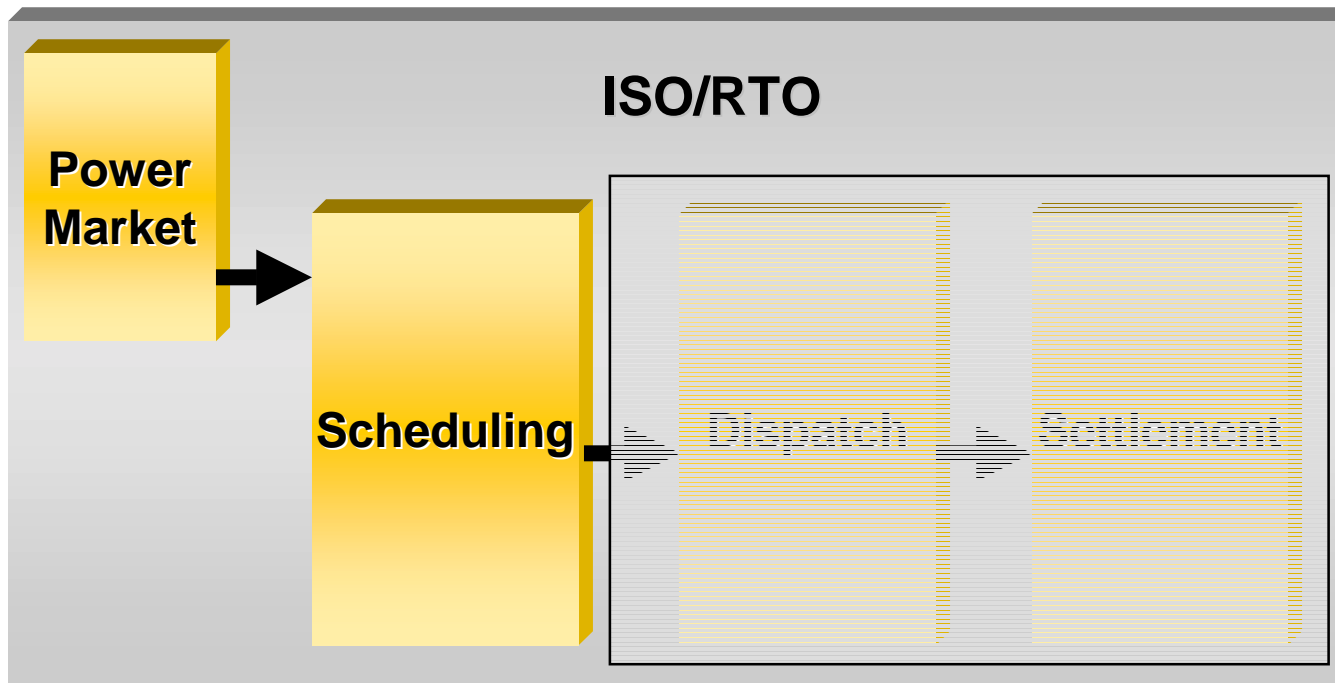
**If previous day bid rejected       $\alpha$  =  $\alpha$  ( previous day) x 0.95**

***Company agents can switch strategies. The decision to switch is made at higher Decision Levels***



# ***Level 2 – Day Ahead Planning***

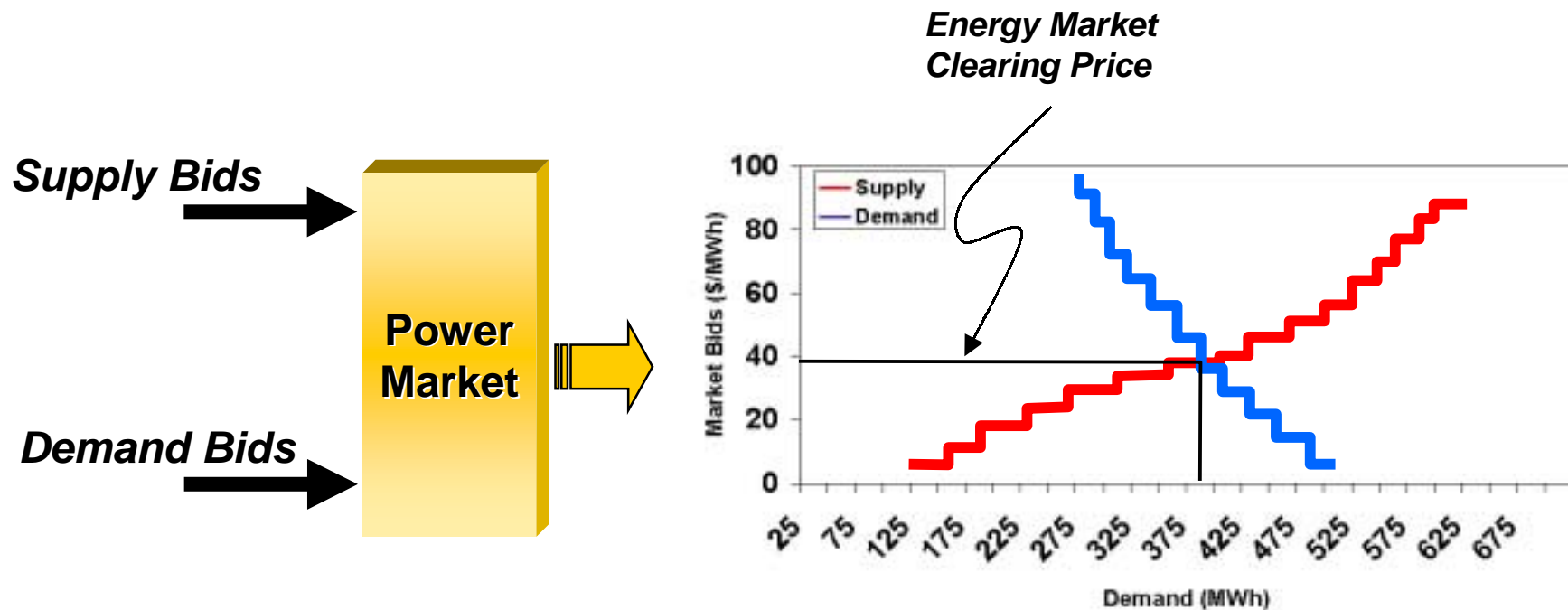
## **The ISO/RTO Exercises Two of Its Functions at this Level**



# ***Level 2 – Day Ahead Planning***

## **The Power Market Function**

### **Ranks the Supply and Demand Bids Received**

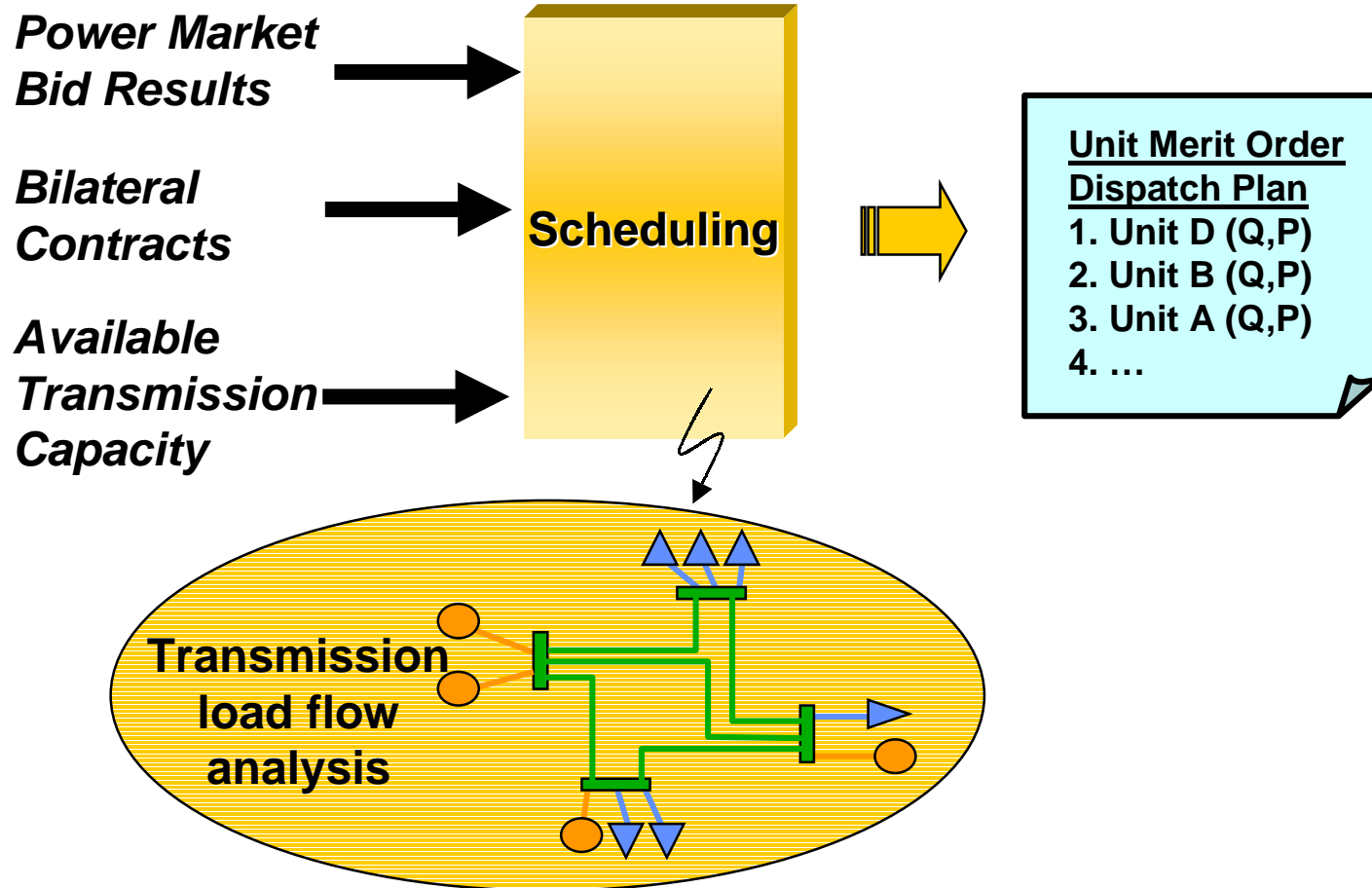


***The Power Market includes  
Energy and Ancillary Services***



# **Level 2 – Day Ahead Planning**

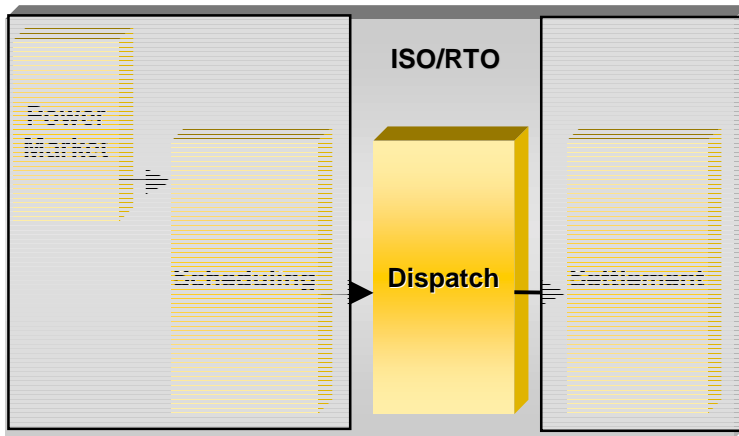
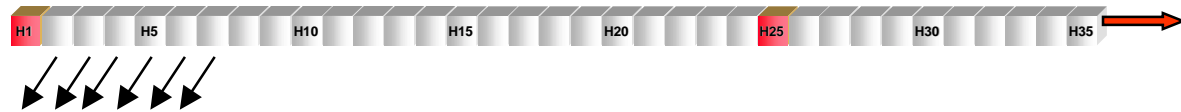
## **Scheduling Combines Power Market Results, Bilateral Contracts, and Transmission Availability**



# Level 1 – Hourly Dispatch

The ISO/RTO Dispatch Function Dispatches the System to Match Actual Supply and Demand

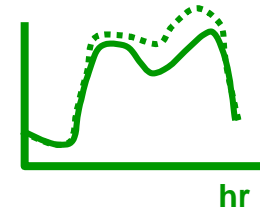
Decision Level 1  
Hourly Dispatch



Customer loads

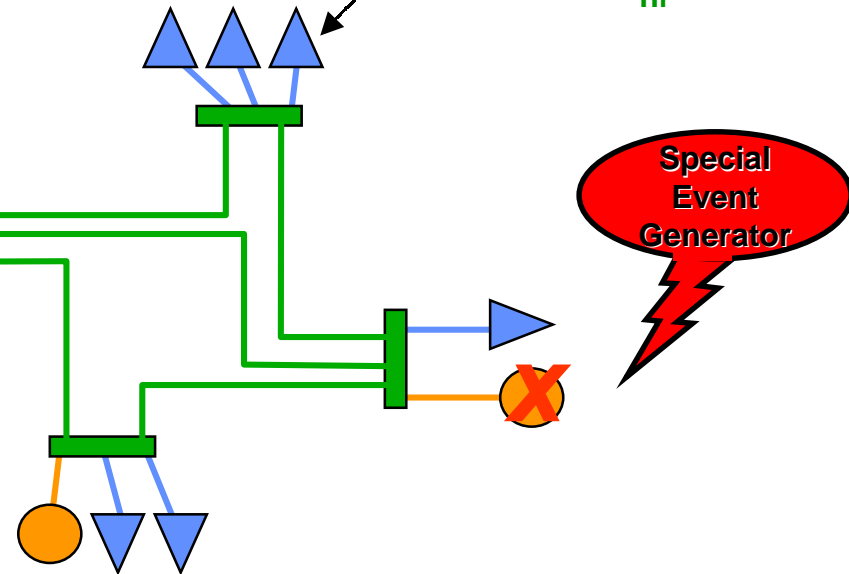
MW

hr



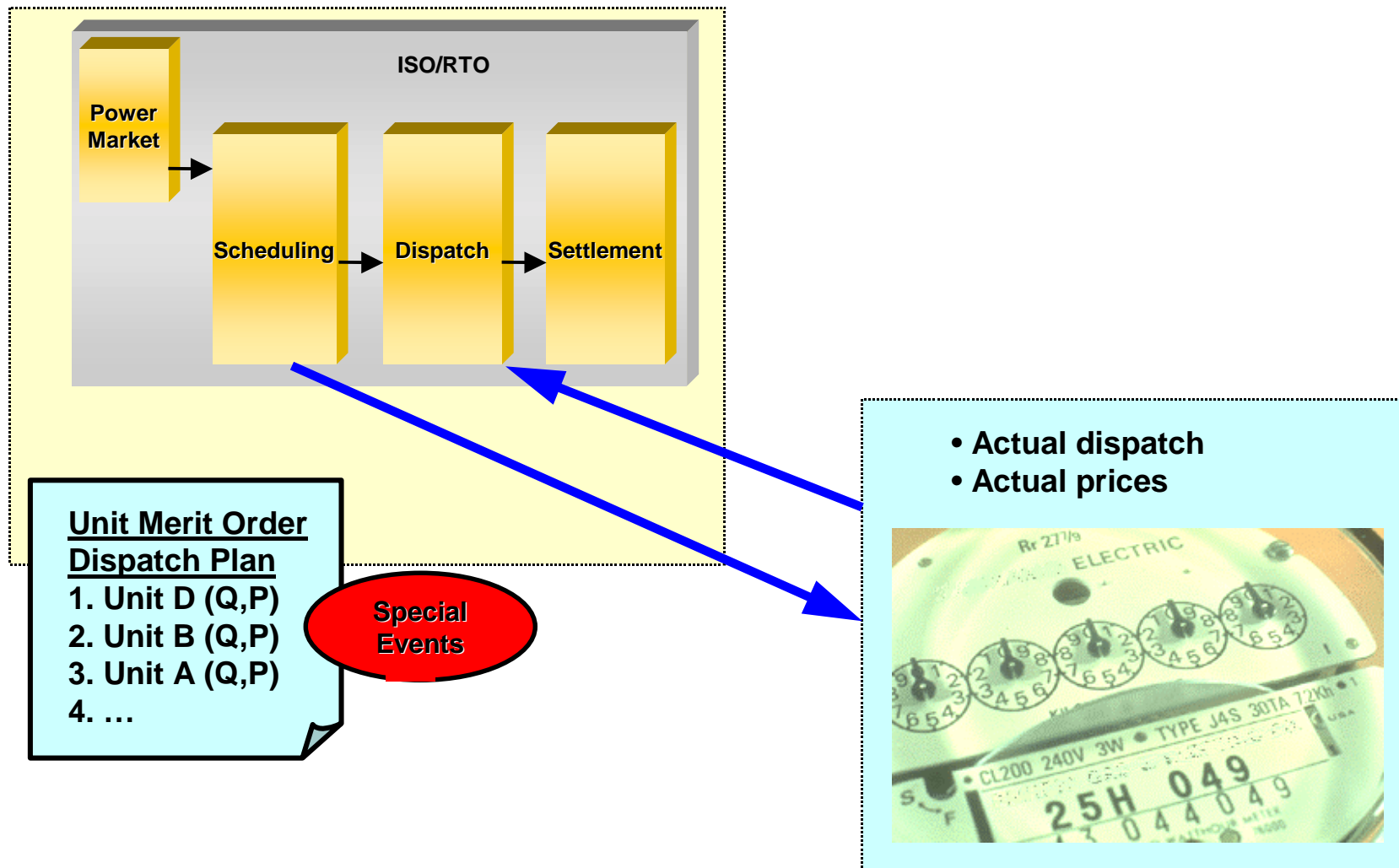
*Dispatch runs the transmission load flow analysis with adjustments*

*Output is actual dispatch, actual prices*



# *Level 1 – Hourly Dispatch*

## The Interface With the Transmission Model Is During Scheduling and Dispatch

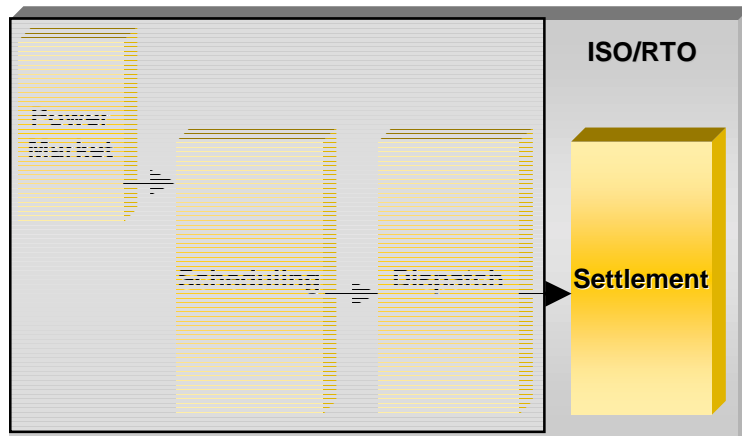




# *Level 1 – Hourly Dispatch*

## The ISO/RTO Settlement Function Computes Charges and Payments Based on Settlement Rules

Decision Level 1  
Hourly Dispatch



### Payments

Generation companies  
Transmission companies

### Charges

Demand companies

*Company “profits” are calculated*

*Customer charges are calculated*



# ***Level 4 – Month Ahead Planning***

## **Companies and Customers Make Adjustments to Their Day Ahead Strategies**

Decision Level 4  
Month Ahead Planning



**Generation  
Company**

- Evaluate and adjust company day ahead strategies

**Demand  
Company**

- Evaluate and adjust company day ahead strategies

**Customers**

- Adjust electricity use in response to prices
- Select alternate supplier and/or supply terms



# The User-Controlled Regulator Can Change the Market Rules

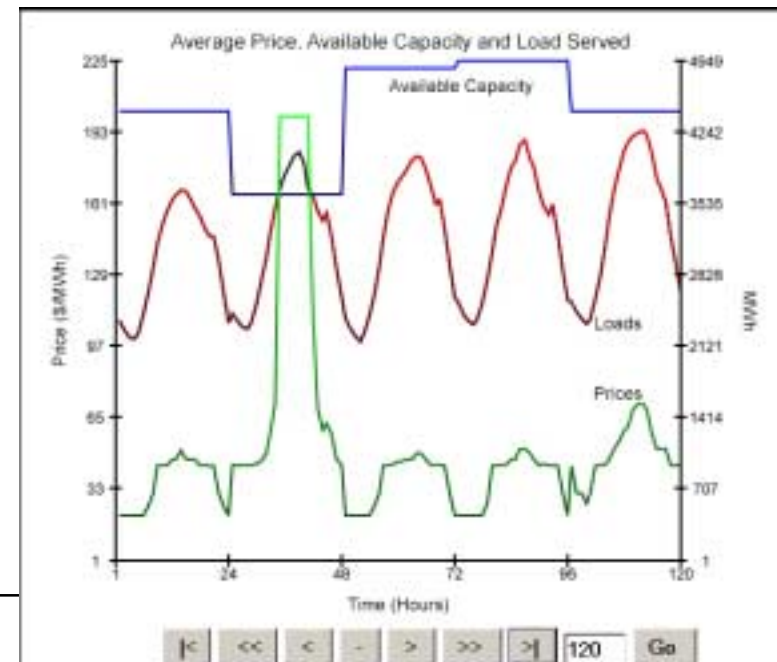
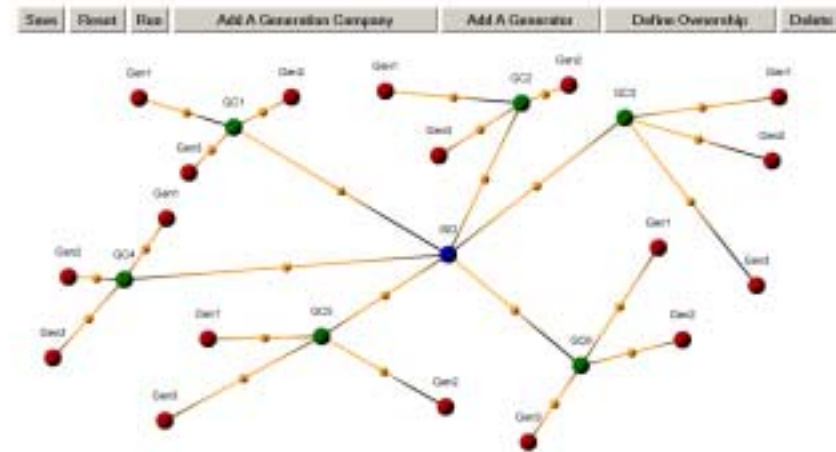
## Regulator

- **Change settlement (payment) rules**
  - Pay Market Clearing Price
  - Pay as Bid
  - Payments for unscheduled dispatch
  - Transmission congestion charges
  - ...others...
- **Change bilateral contract rules**
  - Allow/Disallow bilateral contracts
  - Transmission contracts
  - ...others...
- **Pricing rules**
  - Price caps
  - Customer tariffs
  - ...others...
- **Others**



# There are Multiple Advantages to the EMCAS Agent-Based Simulation

- Decentralized decision making is represented
- Alternative company strategies can be simulated
- Adaptation occurs in the simulation
- Market rules can be tested
- Transient conditions can be studied
- Contributors to system problems can be identified



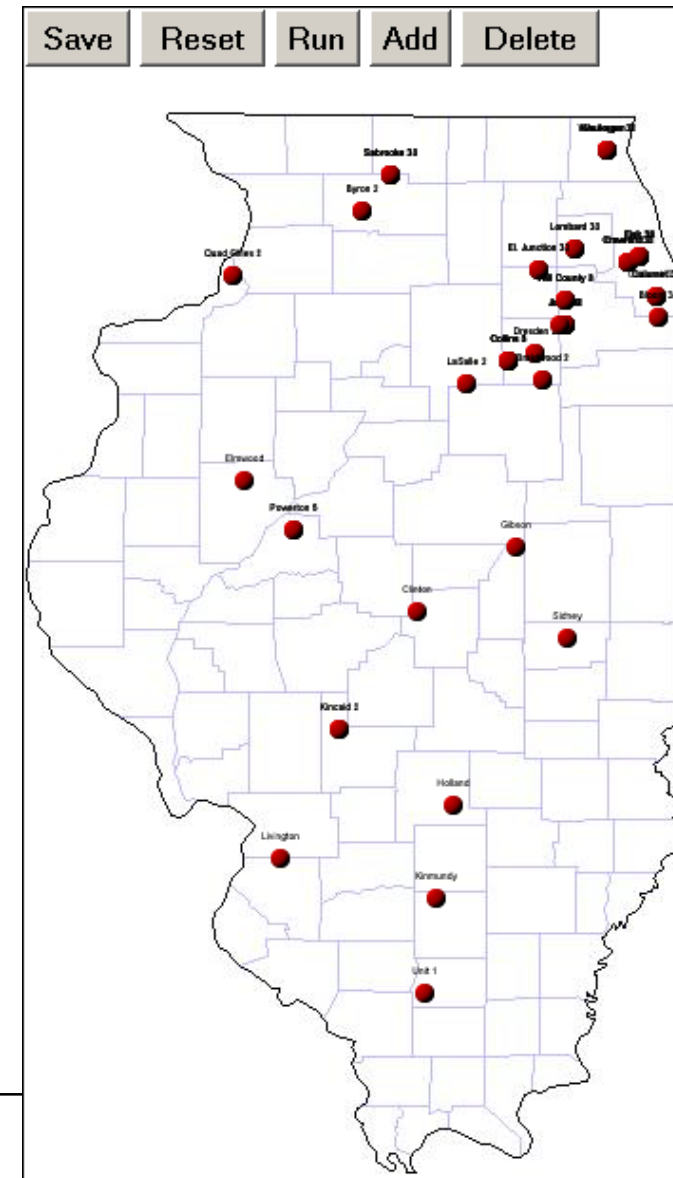
# ANL is Using EMCAS to Evaluate the Potential Impacts of Transmission Constraints on the Operation of a Competitive Electricity Market in Illinois

- **Study will determine if transmission system in Illinois and the surrounding region can support a competitive electricity market**

- Will it support effective competition to keep prices in check
- Will it allow for new market participants to effectively compete for market share
- Could conditions occur that would enable a company to exercise market power in one or more portions of the state and thereby create undue pressure on the prices
- Could conditions occur that would enable a company to inhibit new market participants from entering the market

- **Analysis is conducted in several stages**

- Identify basic problem areas
- Analyze competitive market structure and behavior
- Analyze effect of adding new generation resources
- Analyze effect of adding new transmission resources
- Analyze effect of alternative market rules



# EMCAS Application and Sample Results

- **EMCAS 30-day simulation showing distribution of generation company price bids in a competitive market. The top 25% of the bids (yellow zone) have the greatest impact on the locational market price. Price spikes are the result of outages in the simulation that prompt companies to increase their bids**
- **EMCAS simulation showing company 30-day profits under different market conditions and different market settlement rules. In this example, one company dominates this market**

